Time Series

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R Markdown

This is an R Markdown document. Markdown is a simple formatting syntax for authoring HTML, PDF, and MS Word documents. For more details on using R Markdown see http://rmarkdown.rstudio.com.

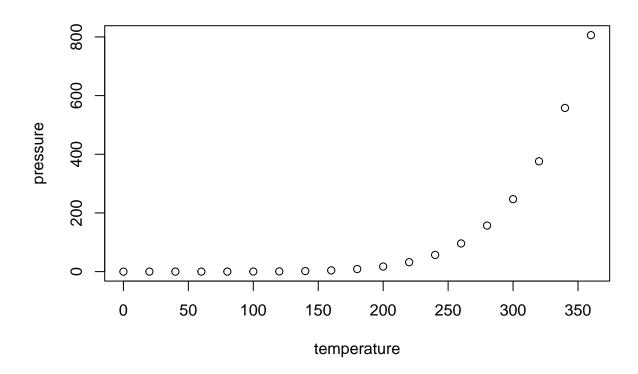
When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

summary(cars)

```
##
        speed
                         dist
##
           : 4.0
                    Min.
                            : 2.00
    Min.
    1st Qu.:12.0
                    1st Qu.: 26.00
##
##
    Median:15.0
                    Median: 36.00
##
    Mean
            :15.4
                    Mean
                            : 42.98
    3rd Qu.:19.0
                    3rd Qu.: 56.00
    Max.
            :25.0
                    Max.
                            :120.00
```

Including Plots

You can also embed plots, for example:



Note that the echo = FALSE parameter was added to the code chunk to prevent printing of the R code that generated the plot.

```
getwd()
```

[1] "/home/guest/R/Patton_Guimond_ENV872_Final_Project"

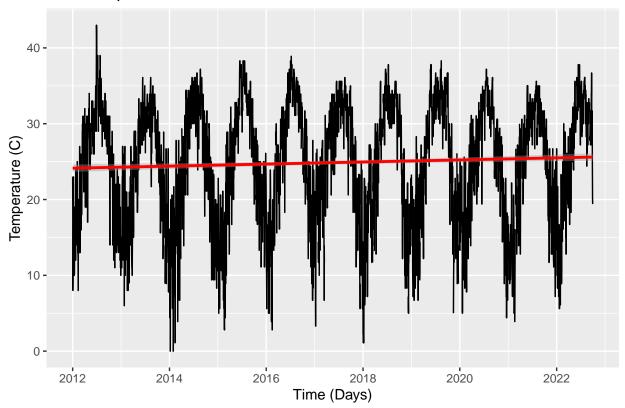
Attaching package: 'lubridate'

##

```
#load packages
library(tidyverse)
## -- Attaching packages --
                                        ----- tidyverse 1.3.2 --
## v ggplot2 3.3.6
                     v purrr
                              0.3.4
## v tibble 3.1.8
                     v dplyr
                              1.0.10
## v tidyr
           1.2.0
                     v stringr 1.4.1
## v readr
           2.1.2
                     v forcats 0.5.2
## -- Conflicts -----
                                         ## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                  masks stats::lag()
library(lubridate)
```

```
## The following objects are masked from 'package:base':
##
##
       date, intersect, setdiff, union
library(zoo)
##
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
##
       as.Date, as.Date.numeric
library(ggplot2)
library(trend)
library(Kendall)
library(tseries)
## Registered S3 method overwritten by 'quantmod':
##
    method
                       from
##
     as.zoo.data.frame zoo
library(dplyr)
#Load Jackson Data
Jackson_Raw <- read.csv("~/R/Patton_Guimond_ENV872_Final_Project/Jackson_TenYear.csv",</pre>
                         stringsAsFactors = TRUE)
Jackson_Wrangle <- Jackson_Raw %>%
  select(YEAR, MO, DAY, TEMPC) %>%
  mutate('date' = make_date(year = YEAR, month = MO, day = DAY))
#Set as date
Jackson_Wrangle$date <- as.Date(Jackson_Wrangle$date, format = "%y/%m/%d")</pre>
#Group by date and find max daily temperature
Daily_High <- Jackson_Wrangle %>%
  group_by(date) %>%
  dplyr::summarize(value = max (TEMPC)) %>%
  as.data.frame()
#Plot max temperatures over time
MaxTemp_Plot \leftarrow ggplot(Daily_High, aes(x = date, y = value)) +
  geom_line()+
  geom_smooth(method=lm, col= 'red')+
 ggtitle("Max Temperatures Over Time")+
 xlab("Time (Days)") + ylab("Temperature (C)")
print(MaxTemp_Plot)
## 'geom_smooth()' using formula 'y ~ x'
## Warning: Removed 74 rows containing non-finite values (stat_smooth).
```

Max Temperatures Over Time



#Look for NA values in data and remove summary(Daily_High\$value)

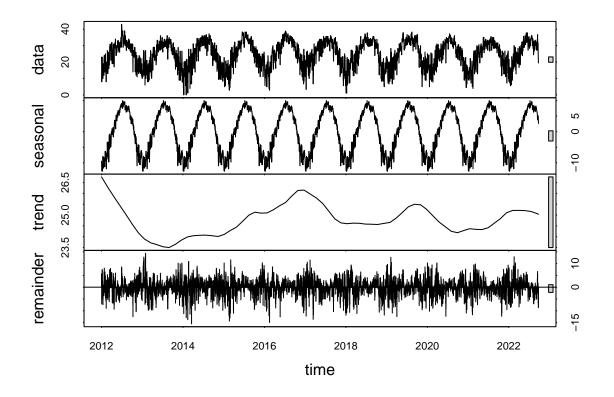
```
## Min. 1st Qu. Median Mean 3rd Qu. Max. NA's ## 0.00 19.40 26.10 24.86 31.10 43.00 74
```

```
Clean_MaxTemp <-
  Daily_High %>%
  mutate(Temp_Clean = zoo::na.approx(value))
summary(Clean_MaxTemp)
```

```
date
                              value
                                             Temp_Clean
##
##
           :2012-01-01
                          Min.
                                 : 0.00
                                           Min. : 0.00
   Min.
   1st Qu.:2014-09-06
                          1st Qu.:19.40
                                           1st Qu.:19.40
##
   Median :2017-05-13
                          Median :26.10
                                           Median :26.10
##
##
   Mean
           :2017-05-14
                          Mean
                                 :24.86
                                           Mean
                                                  :24.87
##
    3rd Qu.:2020-01-19
                          3rd Qu.:31.10
                                           3rd Qu.:31.10
           :2022-09-30
                                  :43.00
                                                  :43.00
##
    Max.
                          Max.
                                           {\tt Max.}
##
                          NA's
                                 :74
```

```
#Filter for date and NA omitted Temp
Max_Temp <- Clean_MaxTemp%>%
   select(date, Temp_Clean)
summary(Max_Temp)
```

```
Temp_Clean
##
         date
##
           :2012-01-01
                               : 0.00
    Min.
                        Min.
                         1st Qu.:19.40
##
    1st Qu.:2014-09-06
   Median :2017-05-13
                         Median :26.10
##
##
    Mean
           :2017-05-14
                         Mean
                                :24.87
    3rd Qu.:2020-01-19
                         3rd Qu.:31.10
##
    Max.
           :2022-09-30
                         Max.
                                :43.00
#Create Time series object and decompose
Daily_High_ts <- ts(Max_Temp$Temp_Clean, start = c(2012,01,01), frequency = 365)
Daily_High_decomp <- stl(Daily_High_ts,s.window = "periodic")</pre>
plot(Daily_High_decomp)
```



```
Daily_Temp_Trend <- Kendall::SeasonalMannKendall(Daily_High_ts)
summary(Daily_Temp_Trend)

## Score = 311 , Var(Score) = 55585
## denominator = 18761.71
## tau = 0.0166, 2-sided pvalue =0.18713

#Subtract seasonality and run seasonally adjusted Mann Kendall
Daily_Components <- as.data.frame(Daily_High_decomp$time.series[,1:3])</pre>
```

```
Daily_Components <- mutate(Daily_Components,</pre>
       Temp_C = Max_Temp$Temp_Clean,
       Date = Max_Temp$date)
TempSeasonAdj <- Daily_Components %>%
 mutate(Subtract.Season = Daily_Components$Temp_C - Daily_Components$seasonal)
summary(TempSeasonAdj)
##
      seasonal
                           trend
                                        remainder
                                                               Temp_C
         :-12.69791
                                                                 : 0.00
## Min.
                       Min.
                              :23.50 Min. :-15.538629
                                                           Min.
## 1st Qu.: -6.70109
                       1st Qu.:24.30
                                      1st Qu.: -2.328569
                                                           1st Qu.:19.40
## Median : 0.66055
                       Median :24.68
                                      Median : 0.178168
                                                           Median :26.10
## Mean
         : 0.09144
                       Mean :24.78
                                       Mean : -0.009183
                                                           Mean
                                                                 :24.87
## 3rd Qu.: 6.68717
                                       3rd Qu.: 2.472921
                       3rd Qu.:25.21
                                                           3rd Qu.:31.10
## Max. : 9.99058 Max.
                             :26.76
                                     Max. : 14.384892
                                                           Max.
                                                                  :43.00
##
                       Subtract.Season
        Date
          :2012-01-01 Min. : 8.489
## Min.
## 1st Qu.:2014-09-06 1st Qu.:22.406
## Median :2017-05-13 Median :24.939
## Mean :2017-05-14 Mean :24.776
## 3rd Qu.:2020-01-19 3rd Qu.:27.316
## Max. :2022-09-30 Max. :38.246
NonSeasonal_Temp_Trend <- Kendall::MannKendall(TempSeasonAdj$Subtract.Season)
summary(NonSeasonal_Temp_Trend)
## Score = 147891 , Var(Score) = 6680121344
## denominator = 7669158
## tau = 0.0193, 2-sided pvalue =0.070381
#Load Jackson Data
KFSI_Clean <- read.csv("~/R/Patton_Guimond_ENV872_Final_Project/KFSI_Clean.csv",
                        stringsAsFactors = TRUE)
KFSI Wrangle <- KFSI Clean %>%
 select(Year, Month, Day, Temperature..F.) %>%
 mutate('date' = make_date(year = Year, month = Month, day = Day)) %%
          mutate('Temp_C' = ((Temperature..F.-32)/1.8 ))
#Set as date
KFSI_Wrangle$date <- as.Date(KFSI_Wrangle$date, format = "%y/%m/%d")</pre>
KFSI_Wrangle_Update <- KFSI_Wrangle %>%
 select(date, Temp_C)
#Group by date and find max daily temperature
Daily_High_KFSI <- KFSI_Wrangle_Update %>%
 group_by(date) %>%
 dplyr::summarize(value = max (Temp_C)) %>%
 as.data.frame()
#Plot max temperatures over time
KFSI_MaxTemp_Plot \leftarrow ggplot(Daily_High_KFSI, aes(x = date, y = value)) +
 geom line()+
 geom_smooth(method=lm, col= 'red')+
```

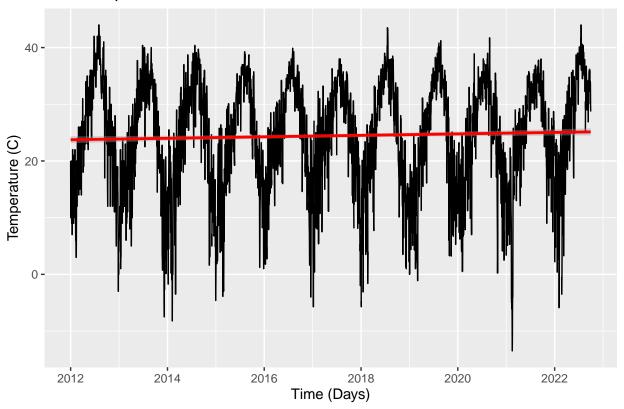
```
ggtitle("Max Temperatures Over Time")+
  xlab("Time (Days)") + ylab("Temperature (C)")
print(KFSI_MaxTemp_Plot)
```

'geom_smooth()' using formula 'y ~ x'

Warning: Removed 43 rows containing non-finite values (stat_smooth).

Warning: Removed 1 row(s) containing missing values (geom_path).

Max Temperatures Over Time



#Look for NA values in data and remove summary(Daily_High_KFSI\$value)

```
## Min. 1st Qu. Median Mean 3rd Qu. Max. NA's ## -13.50 17.78 25.72 24.43 32.39 44.00 43
```

```
KFSI_Filtered_Date <- Daily_High_KFSI %>%
  filter(between(date, as.Date("2012-01-10"), as.Date("2022-09-30")))

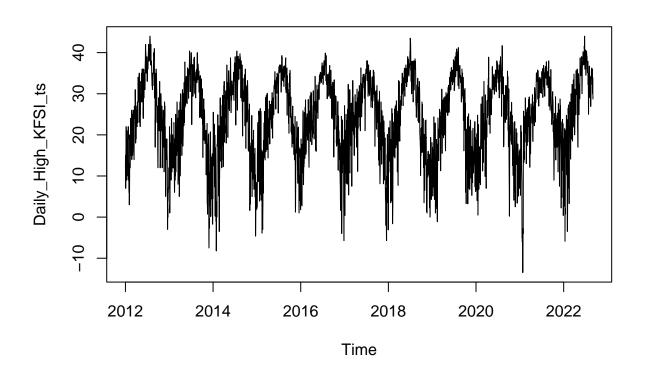
Clean_MaxTemp_KSFI <-
   KFSI_Filtered_Date %>%
  mutate(Temp_Clean = zoo::na.approx(value))
summary(Clean_MaxTemp_KSFI)
```

```
##
         date
                              value
                                              Temp_Clean
           :2012-01-10
                                 :-13.50
                                                   :-13.50
##
    Min.
                          Min.
                                           Min.
##
    1st Qu.:2014-09-10
                          1st Qu.: 17.89
                                            1st Qu.: 17.78
    Median :2017-05-13
                          Median : 25.72
                                            Median : 25.72
##
##
    Mean
           :2017-05-17
                          Mean
                                 : 24.45
                                            Mean
                                                   : 24.44
    3rd Qu.:2020-01-20
                          3rd Qu.: 32.39
                                            3rd Qu.: 32.39
##
                                            Max.
##
    Max.
           :2022-09-30
                          Max.
                                 : 44.00
                                                   : 44.00
                          NA's
##
                                 :42
Clean_MaxTemp_KSFI <- Clean_MaxTemp_KSFI %>%
  select(date,Temp_Clean)
summary(Clean_MaxTemp_KSFI)
```

```
##
         date
                           Temp_Clean
           :2012-01-10
                               :-13.50
##
   Min.
                         Min.
   1st Qu.:2014-09-10
                         1st Qu.: 17.78
##
   Median :2017-05-13
                         Median : 25.72
##
   Mean
           :2017-05-17
                         Mean
                               : 24.44
##
   3rd Qu.:2020-01-20
                         3rd Qu.: 32.39
           :2022-09-30
                                : 44.00
##
   Max.
                         Max.
```

#Create Time series object and decompose

Daily_High_KFSI_ts <- ts(Clean_MaxTemp_KSFI\$Temp_Clean, start = c(2012,01,01), frequency = 365)
Daily_High_KFSI_decomp <- stl(Daily_High_KFSI_ts,s.window = "periodic")
plot(Daily_High_KFSI_ts)</pre>



```
Daily_Temp_Trend_KFSI <- Kendall::SeasonalMannKendall(Daily_High_KFSI_ts)
summary(Daily_Temp_Trend_KFSI)
## Score = 259 , Var(Score) = 55246.33
## denominator = 18787.33
## tau = 0.0138, 2-sided pvalue =0.2705
#Subtract seasonality and run seasonally adjusted Mann Kendall
Daily_Components_KFSI <- as.data.frame(Daily_High_KFSI_decomp$time.series[,1:3])
Daily_Components_KFSI <- mutate(Daily_Components_KFSI,</pre>
       Temp_C = Clean_MaxTemp_KSFI$Temp_Clean,
       Date = Clean_MaxTemp_KSFI$date)
TempSeasonAdj KFSI <- Daily Components KFSI %>%
 mutate(Subtract.Season = Daily_Components_KFSI$Temp_C - Daily_Components_KFSI$seasonal)
summary(TempSeasonAdj_KFSI)
##
      seasonal
                          trend
                                       remainder
                                                              Temp C
## Min. :-15.4988 Min. :22.91 Min. :-23.595564 Min. :-13.50
## 1st Qu.: -7.4985 1st Qu.:23.58 1st Qu.: -2.666245 1st Qu.: 17.78
## Median: 0.4756 Median: 24.14 Median: 0.423844 Median: 25.72
## Mean : 0.1504 Mean :24.29 Mean : 0.001064 Mean : 24.44
## 3rd Qu.: 8.0260 3rd Qu.:24.80
                                     3rd Qu.: 3.065015 3rd Qu.: 32.39
## Max. : 12.6716 Max.
                            :26.54 Max. : 16.728707 Max.
                                                                : 44.00
##
        Date
                       Subtract.Season
## Min.
          :2012-01-10 Min.
                             :-0.413
## 1st Qu.:2014-09-10 1st Qu.:21.575
## Median :2017-05-13 Median :24.742
## Mean
          :2017-05-17
                       Mean :24.291
## 3rd Qu.:2020-01-20
                        3rd Qu.:27.463
          :2022-09-30
## Max.
                        Max.
                              :41.731
NonSeasonal_Temp_Trend_KFSI <- Kendall::MannKendall(TempSeasonAdj_KFSI$Subtract.Season)
summary(NonSeasonal_Temp_Trend_KFSI)
## Score = 99744 , Var(Score) = 6568209920
## denominator = 7583478
## tau = 0.0132, 2-sided pvalue = 0.21843
#Load Data
KLSF_Clean <- read.csv("~/R/Patton_Guimond_ENV872_Final_Project/KLSF_Clean.csv",</pre>
                        stringsAsFactors = TRUE)
KLSF_Wrangle <- KLSF_Clean %>%
 select(Year, Month, Day, Temperature..F.) %>%
 mutate('date' = make_date(year = Year, month = Month, day = Day)) %>%
          mutate('Temp_C' = ((Temperature..F.-32)/1.8 ))
#Set as date
KLSF Wrangle$date <- as.Date(KLSF Wrangle$date, format = "%y/%m/%d")
KLSF_Wrangle_Update <- KLSF_Wrangle %>%
```

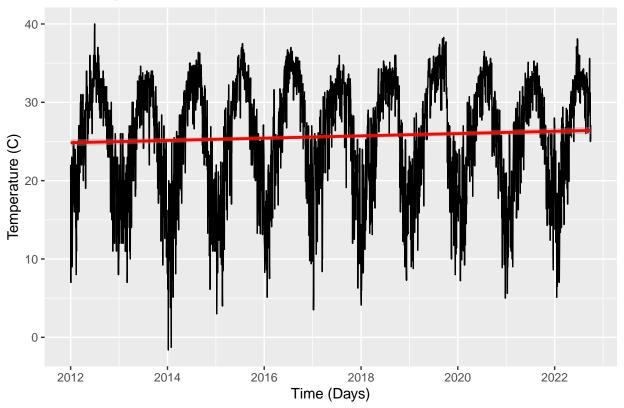
```
#Group by date and find max daily temperature
Daily_High_KLSF <- KLSF_Wrangle_Update %>%
  group_by(date) %>%
  dplyr::summarize(value = max (Temp_C)) %>%
  as.data.frame()
#Plot max temperatures over time
KLSF_MaxTemp_Plot <- ggplot(Daily_High_KLSF, aes(x = date, y = value)) +
  geom_line()+
  geom_smooth(method=lm, col= 'red')+
  ggtitle("Max Temperatures Over Time")+
  xlab("Time (Days)") + ylab("Temperature (C)")
print(KLSF_MaxTemp_Plot)</pre>
```

'geom_smooth()' using formula 'y ~ x'

Warning: Removed 28 rows containing non-finite values (stat_smooth).

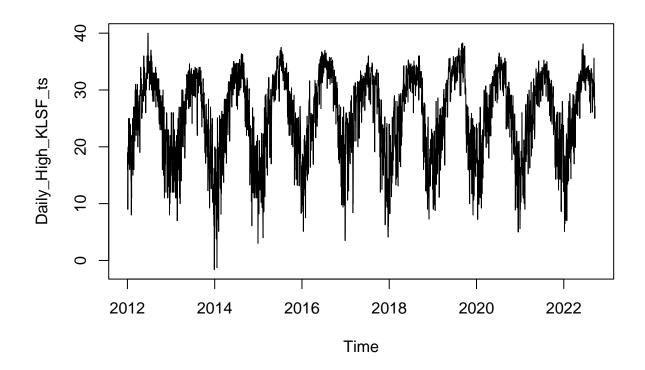
Warning: Removed 1 row(s) containing missing values (geom_path).

Max Temperatures Over Time



#Look for NA values in data and remove summary(Daily_High_KLSF\$value)

```
Min. 1st Qu. Median
                             Mean 3rd Qu.
                                                      NA's
## -1.611 20.389 27.000 25.620 31.611 40.000
KLSF_Filtered_Date <- Daily_High_KLSF %>%
  filter(between(date, as.Date("2012-01-10"), as.Date("2022-09-30")))
Clean_MaxTemp_KLSF <-</pre>
  KLSF_Filtered_Date %>%
  mutate(Temp_Clean = zoo::na.approx(value))
summary(Clean_MaxTemp_KLSF)
##
         date
                             value
                                            Temp_Clean
## Min.
           :2012-01-10
                                :-1.611
                                                 :-1.611
                       \mathtt{Min}.
                                         Min.
  1st Qu.:2014-09-15
                        1st Qu.:20.500
                                          1st Qu.:20.389
## Median :2017-05-21
                        Median :27.000
                                          Median :27.000
## Mean :2017-05-20
                        Mean :25.637
                                          Mean
                                                 :25.624
## 3rd Qu.:2020-01-24
                         3rd Qu.:31.611
                                          3rd Qu.:31.611
## Max. :2022-09-30
                         Max.
                                :40.000
                                          Max.
                                                :40.000
##
                         NA's
                                :27
Clean_MaxTemp_KLSF <- Clean_MaxTemp_KLSF %>%
  select(date,Temp_Clean)
summary(Clean_MaxTemp_KLSF)
##
         date
                           Temp_Clean
## Min.
           :2012-01-10
                         Min.
                               :-1.611
## 1st Qu.:2014-09-15
                        1st Qu.:20.389
                        Median :27.000
## Median :2017-05-21
                               :25.624
## Mean
           :2017-05-20
                         Mean
                         3rd Qu.:31.611
## 3rd Qu.:2020-01-24
## Max.
          :2022-09-30
                        Max.
                              :40.000
#Create Time series object and decompose
Daily_High_KLSF_ts <- ts(Clean_MaxTemp_KLSF$Temp_Clean, start = c(2012,01,01), frequency = 365)
Daily_High_KLSF_decomp <- stl(Daily_High_KLSF_ts,s.window = "periodic")</pre>
plot(Daily_High_KLSF_ts)
```

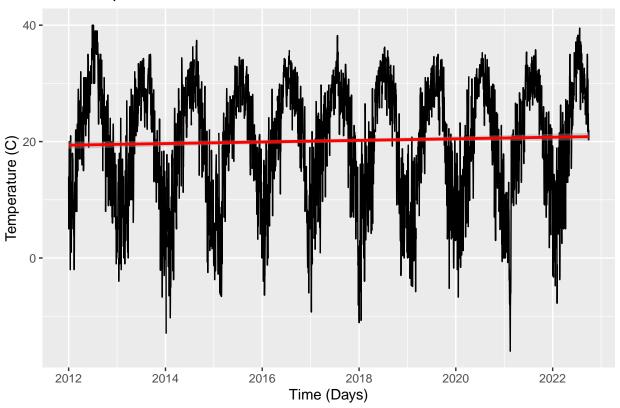


```
Daily_Temp_Trend_KLSF <- Kendall::SeasonalMannKendall(Daily_High_KLSF_ts)
summary(Daily_Temp_Trend_KLSF)
## Score = 516 , Var(Score) = 55828</pre>
```

```
seasonal
                                                                 Temp_C
##
                           trend
                                         remainder
           :-14.3996
                       Min.
                              :24.09
                                              :-14.281380
                                                             Min.
                                                                    :-1.611
   1st Qu.: -5.6971
                       1st Qu.:25.12
                                       1st Qu.: -1.994731
                                                             1st Qu.:20.389
##
##
   Median :
             0.4740
                       Median :25.47
                                       Median: 0.242664
                                                             Median :27.000
##
   Mean
          : 0.1142
                       Mean
                              :25.52
                                       Mean
                                              : -0.005578
                                                             Mean
                                                                    :25.624
   3rd Qu.: 6.1801
                       3rd Qu.:25.90
                                       3rd Qu.: 2.216205
                                                             3rd Qu.:31.611
##
          : 8.7081
                       Max.
                              :27.32
                                              : 11.897186
                                                                    :40.000
##
   Max.
                                       Max.
                                                            Max.
```

```
##
         Date
                        Subtract.Season
          :2012-01-10 Min. : 9.977
## Min.
## 1st Qu.:2014-09-15
                        1st Qu.:23.424
## Median :2017-05-21
                        Median :25.760
## Mean :2017-05-20
                        Mean :25.510
## 3rd Qu.:2020-01-24
                        3rd Qu.:27.755
          :2022-09-30
                        Max.
## Max.
                              :37.298
NonSeasonal_Temp_Trend_KLSF <- Kendall::MannKendall(TempSeasonAdj_KLSF$Subtract.Season)
summary(NonSeasonal_Temp_Trend_KLSF)
## Score = 213555 , Var(Score) = 6654576640
## denominator = 7649784
## tau = 0.0279, 2-sided pvalue = 0.0088482
#Load Data
KTBN_Clean <- read.csv("~/R/Patton_Guimond_ENV872_Final_Project/KTBN_Clean.csv",
                         stringsAsFactors = TRUE)
KTBN_Wrangle <- KTBN_Clean %>%
  select(Year, Month, Day, Temperature..F.) %>%
  mutate('date' = make_date(year = Year, month = Month, day = Day)) %>%
          mutate('Temp_C' = ((Temperature..F.-32)/1.8 ))
#Set as date
KTBN_Wrangle$date <- as.Date(KTBN_Wrangle$date, format = "%y/%m/%d")</pre>
KTBN_Wrangle_Update <- KTBN_Wrangle %>%
  select(date, Temp_C)
#Group by date and find max daily temperature
Daily_High_KTBN <- KTBN_Wrangle_Update %>%
  group_by(date) %>%
  dplyr::summarize(value = max (Temp_C)) %>%
  as.data.frame()
#Plot max temperatures over time
KTBN_MaxTemp_Plot <- ggplot(Daily_High_KTBN, aes(x = date, y = value)) +
  geom_line()+
  geom_smooth(method=lm, col= 'red')+
ggtitle("Max Temperatures Over Time")+
 xlab("Time (Days)") + ylab("Temperature (C)")
print(KTBN MaxTemp Plot)
## 'geom_smooth()' using formula 'y ~ x'
## Warning: Removed 51 rows containing non-finite values (stat_smooth).
## Warning: Removed 1 row(s) containing missing values (geom_path).
```

Max Temperatures Over Time



#Look for NA values in data and remove summary(Daily_High_KTBN\$value)

```
## Min. 1st Qu. Median Mean 3rd Qu. Max. NA's ## -16.00 13.00 21.78 20.12 28.39 40.00 51
```

```
KTBN_Filtered_Date <- Daily_High_KTBN %>%
  filter(between(date, as.Date("2012-01-10"), as.Date("2022-09-30")))

Clean_MaxTemp_KTBN <-
  KTBN_Filtered_Date %>%
  mutate(Temp_Clean = zoo::na.approx(value))
summary(Clean_MaxTemp_KTBN)
```

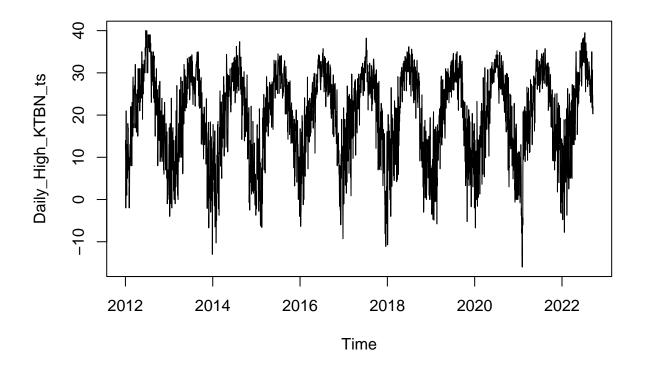
```
##
         date
                             value
                                            Temp_Clean
           :2012-01-10
                         Min. :-16.00
                                                 :-16.00
   Min.
                                          Min.
   1st Qu.:2014-09-16
                         1st Qu.: 13.00
                                          1st Qu.: 13.00
##
   Median :2017-05-21
                         Median : 21.89
                                          Median : 21.89
##
   Mean
##
           :2017-05-21
                         Mean : 20.14
                                          Mean
                                                : 20.10
##
   3rd Qu.:2020-01-25
                         3rd Qu.: 28.39
                                          3rd Qu.: 28.39
           :2022-09-30
                         Max. : 40.00
##
   Max.
                                          Max.
                                                 : 40.00
##
                         NA's
                               :50
```

```
Clean_MaxTemp_KTBN <- Clean_MaxTemp_KTBN %>%
    select(date,Temp_Clean)
summary(Clean_MaxTemp_KTBN)
```

```
##
         date
                           Temp_Clean
##
           :2012-01-10
                         Min.
                                :-16.00
   Min.
                         1st Qu.: 13.00
   1st Qu.:2014-09-16
##
##
   Median :2017-05-21
                         Median: 21.89
##
   Mean
           :2017-05-21
                         Mean
                               : 20.10
##
   3rd Qu.:2020-01-25
                         3rd Qu.: 28.39
           :2022-09-30
##
   Max.
                         Max.
                               : 40.00
```

$\#Create\ Time\ series\ object\ and\ decompose$

Daily_High_KTBN_ts <- ts(Clean_MaxTemp_KTBN\$Temp_Clean, start = c(2012,01,01), frequency = 365)
Daily_High_KTBN_decomp <- stl(Daily_High_KTBN_ts,s.window = "periodic")
plot(Daily_High_KTBN_ts)</pre>



Daily_Temp_Trend_KTBN <- Kendall::SeasonalMannKendall(Daily_High_KTBN_ts)
summary(Daily_Temp_Trend_KTBN)</pre>

```
## Score = 198 , Var(Score) = 55897.33
## denominator = 18961.09
## tau = 0.0104, 2-sided pvalue =0.40233
```

```
{\tt Temp\_C}
##
      seasonal
                       trend
                                  remainder
## Min. :-16.2568 Min. :18.41 Min. :-21.77471
                                                  Min. :-16.00
## 1st Qu.: -8.0484 1st Qu.:19.14 1st Qu.: -3.14954 1st Qu.: 13.00
## Median: 0.9259 Median:19.73 Median: 0.24165
                                                  Median : 21.89
## Mean : 0.1608 Mean :19.95 Mean : -0.01088
                                                  Mean : 20.10
## 3rd Qu.: 8.7576 3rd Qu.:20.71
                                 3rd Qu.: 3.25264
                                                   3rd Qu.: 28.39
## Max. : 13.1527 Max. :23.62 Max. : 19.76405 Max. : 40.00
##
      Date
                     Subtract.Season
## Min. :2012-01-10 Min. :-2.433
## 1st Qu.:2014-09-16 1st Qu.:16.824
## Median :2017-05-21 Median :20.204
## Mean :2017-05-21 Mean :19.940
## 3rd Qu.:2020-01-25
                     3rd Qu.:23.337
## Max. :2022-09-30 Max. :40.913
```

 $\label{lem:lemp_trend_KTBN} $$\operatorname{MannKendall}(TempSeasonAdj_KTBN\$Subtract.Season) summary(NonSeasonal_Temp_Trend_KTBN)$$

```
## Score = 82704 , Var(Score) = 6644377088
## denominator = 7642031
## tau = 0.0108, 2-sided pvalue = 0.3103
```